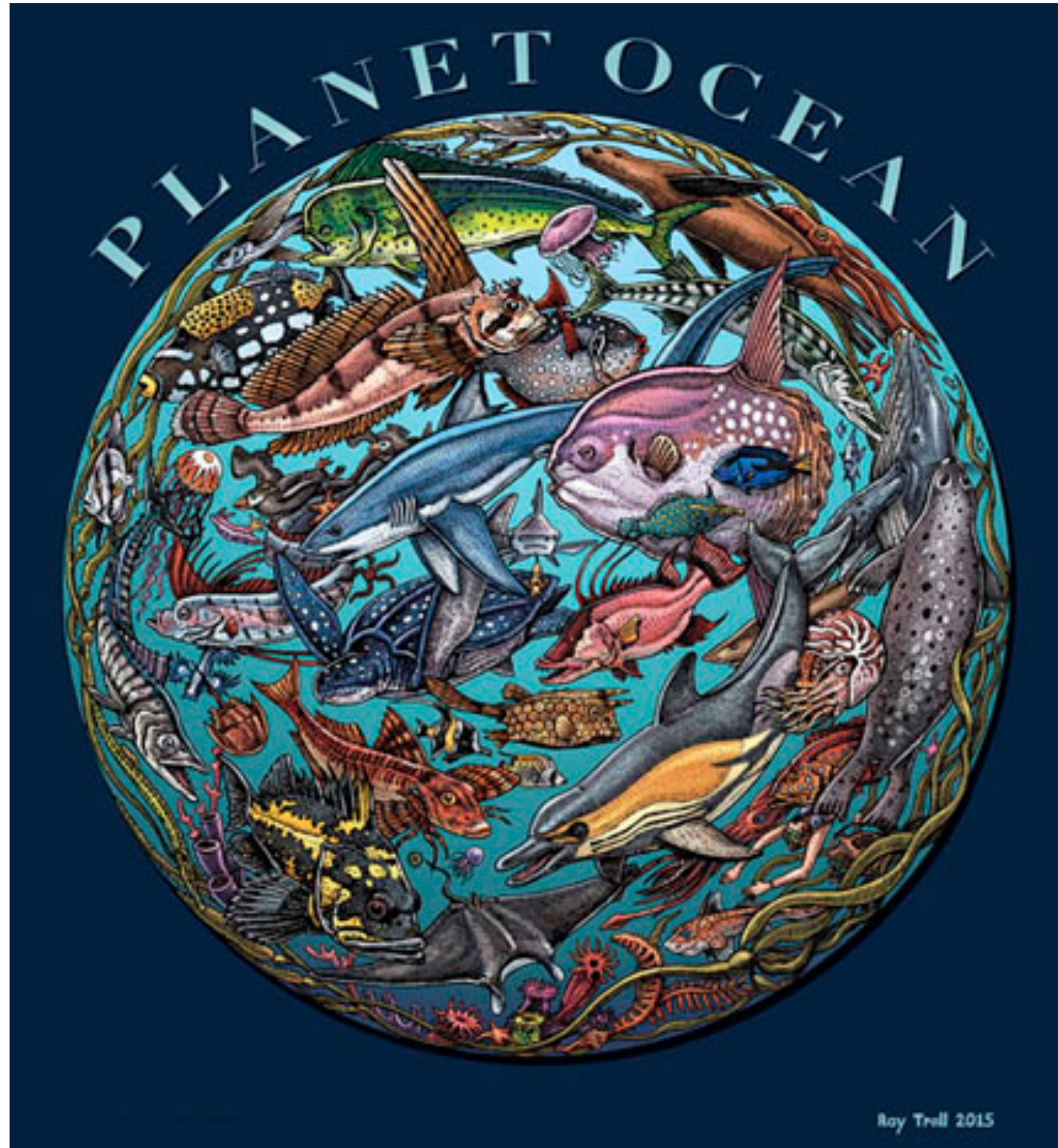
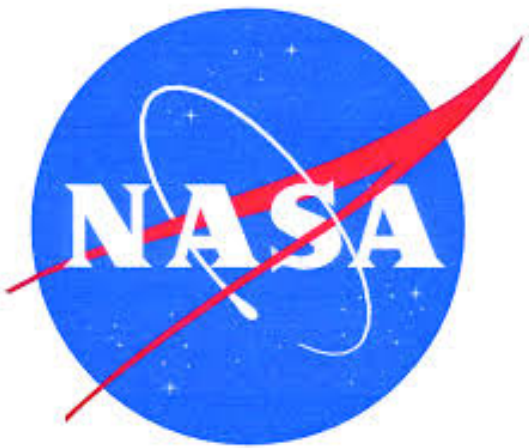


Santa Barbara Channel Marine Biodiversity Observation Network



***Marine Science Institute
University of California Santa Barbara***

Who we are

Principal/Associate Investigators

Marine Science Institute

Robert Miller, Andrew Rassweiler, Daniel Reed, Milton Love

Ecology Evolution and Marine Biology

Craig Carlson, Deborah Iglesias-Rodriguez, Doug McCauley

Geography

David Siegel, Phaedon Kyriakidis

Electrical and Computer Engineering

BS Manjunath

USGS

Kevin Lafferty

UCSD - SIO

John Hildebrand

NOAA – NMFS SWFSC

Andrew Thompson





Partners

Channel Islands National Marine Sanctuary

Channel Islands National Park

Santa Barbara Coastal Long Term Ecological Research Program

Plumes and Blooms

Southern California Coastal Water Research Project

Southern California Coastal Ocean Observing System (SCCOOS)

Gray Whales Count

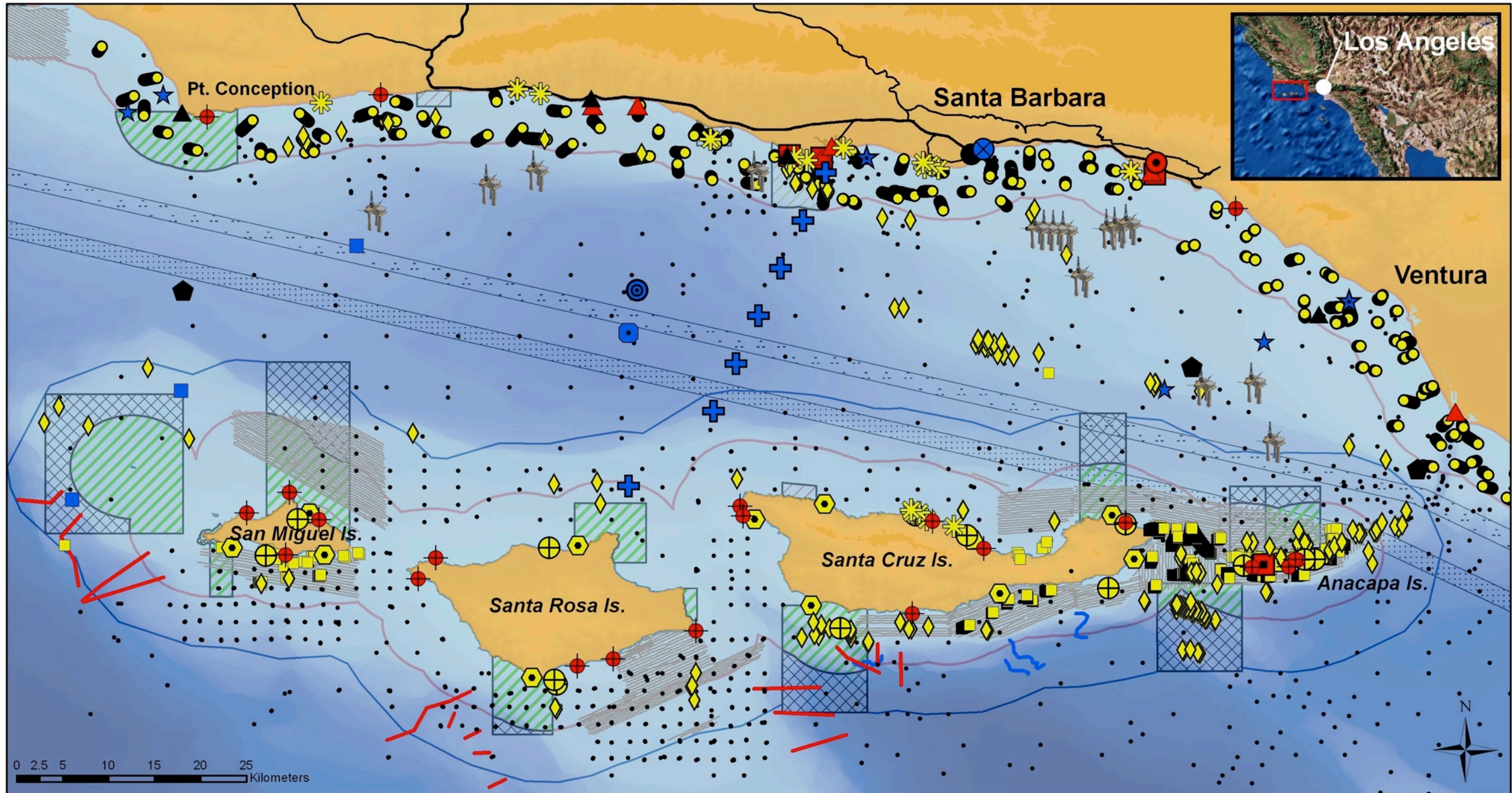
San Onofre Nuclear Generating Station Mitigation Monitoring

CalCOFI



Existing Monitoring Partners

Santa Barbara Channel, California



Legend

- | | | |
|-----------------------------|----------------------------------|--------------------------------|
| ★ CalCOFI | ● SCCOOS CDIP Buoy | ● CINP/MARINE Rocky Intertidal |
| ★ CalCOFI / SCCOOS | ▲ SCCOOS HF Radar | ◆ Love Submersible Survey |
| ■ NOAA NMFS Midwater Trawls | ● SCCOOS Manual Shore Station | ✱ SBC LTER |
| ● Mark VI Sediment Trap | ◆ SCCOOS Automated Shore Station | ⊕ CNIP Kelp Forest |
| ● SIO Whale Acoustics | ■ LIMPETS Rocky Intertidal | ⊕ CINMS OB Moorings |
| ● SCCOOS HAB Monitoring | ▲ LIMPETS Beach | ● USGS ROV Video |
| ⊕ Plumes and Blooms | ● SONGS Estuary Monitoring | ■ USGS Scuba-ROV Surveys |

Blue = Pelagic, Black = Oceanography, Red = Intertidal, Yellow = Benthic/Subtidal

- | | |
|----------------------------|----------------------------------|
| ● Love Oil Platform Survey | ● USGS Sediment Samples |
| — USGS Survey Tracks | — CINMS Deep Sea Coral Transects |
| — CINMS OE Transects | — CA State Water |
| ■ Federal MPA | ■ CINMS Boundary |

- | |
|-------------------|
| — Shipping North |
| — Shipping South |
| ■ SMCA |
| ■ SMCA (No-Take) |
| ■ SMP |
| ■ SMR |
| ■ SMRMA |
| ■ Special Closure |

Bathymetry
Depth (m)
0
-1939

Projection: NAD 1983

CalCOFI - California Cooperative Oceanic Fisheries Investigations
SCCOOS - Southern California Coastal Ocean Observing System
NOAA - National Oceanic & Atmospheric Administration
NMFS - National Marine Fisheries Service
SIO - Scripps Institution of Oceanography
HAB - Harmful Algal Blooms
CDIP - Coastal Data Information Program
HF - High Frequency
LIMPETS - Long-term Monitoring Program & Experimental Training for Students
SONGS - San Onofre Nuclear Generating Station
SBC LTER - Santa Barbara Coastal Long-term Ecological Research
CNIP - Channel Islands National Park
MARINE - Multi-Agency Rocky Intertidal Network
CINMS - Channel Islands National Marine Sanctuary
ROV - Remotely Operated Vehicle
USGS - United States Geological Survey
MPA - Marine Protected Area
SMCA - State Marine Conservation Area
SMP - State Marine Park
SMR - State Marine Reserve
SMRMA - State Marine Recreational Management Area

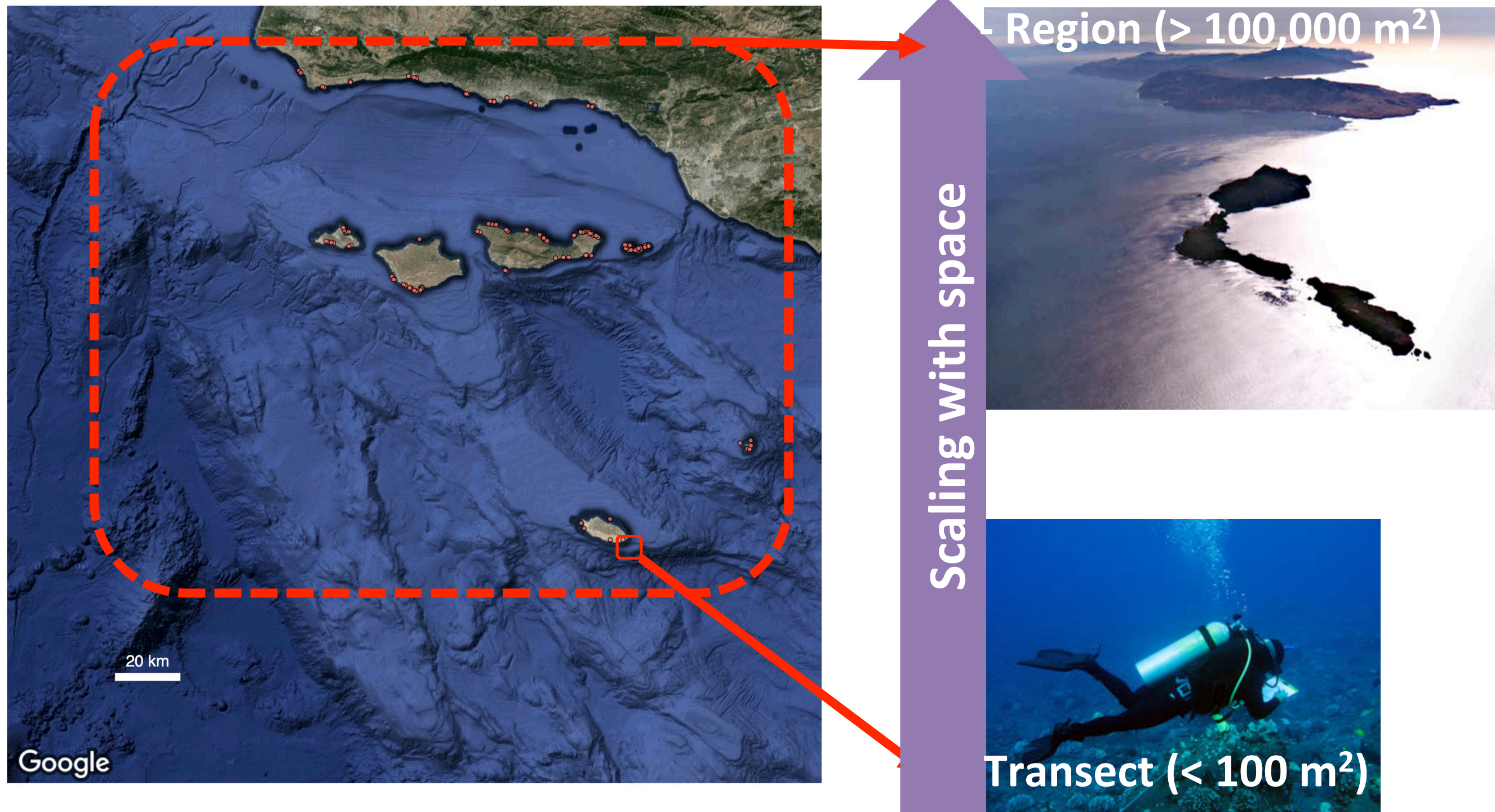
SANTA BARBARA CHANNEL (SBC) BON

Goals:

1. Integrate biodiversity data to enable inferences about regional biodiversity
2. Develop advanced methods in optical and acoustic imaging and genomics for monitoring biodiversity in partnership with ongoing monitoring and research programs
3. Implement a tradeoff framework that optimizes allocation of sampling effort

Complex and multiscale patterns of community structure

Communities are spatially structured at **multiple scales**. The spatial variation in community composition is **beta diversity**



variation in community composition

38%

— Biogeographic trend

11%

— Positive spatial structures

7%

— Negative spatial structures

44%

— Random noise
(error)

Lamy et al., in prep

Site scores - Canonical axis 1 (9.1%)

$F_{1,127} = 13.55, P < 0.001$

Site scores - Canonical axis 1 (5.7%)

$F_{1,127} = 8.18, P < 0.001$

133 samples

2005-2014

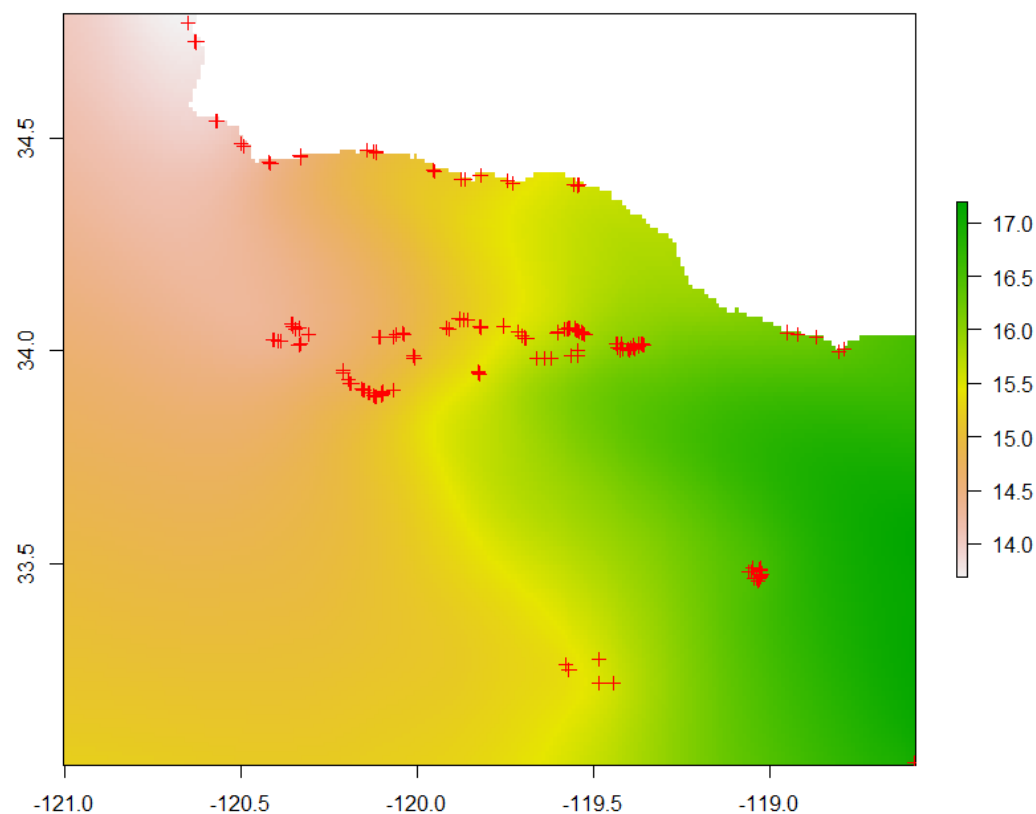
CINP, LTER, PISCO,

USGS

What are the ecological processes and environmental drivers underlying each of these scales?



Average temperature from 2005-2014



Identifying environmental drivers

- Physical environment (SST, Bathymetry, substrate, slope)
- Pelagic primary production (Chl *a*)
- Benthic primary production (Kelp biomass)
- Disturbance regime (wave height, ENSO)
- Connectivity - source and destination strength

Landsat Kelp Forest Biomass

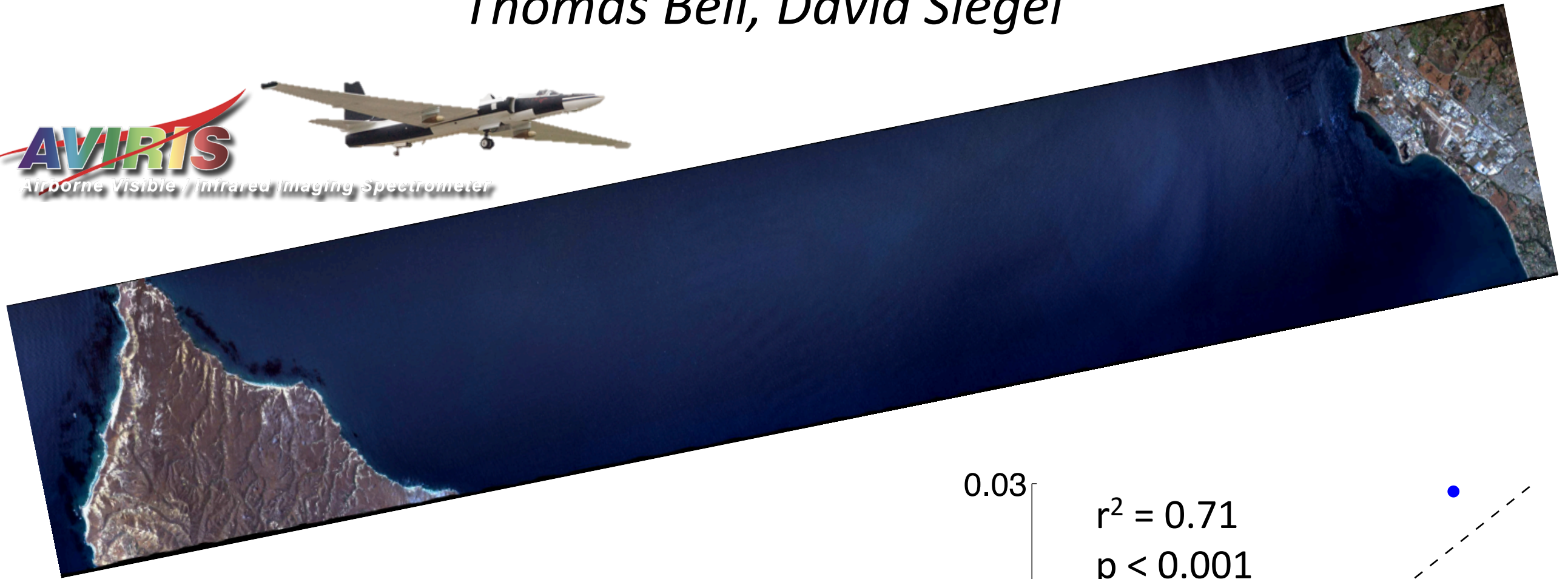
- 30 m resolution multispectral imagery
- Kelp reflectance calibrated to biomass measured by divers in SBC LTER long-term plots
- SBC time series includes ~ 6-8 usable images per year since 1984 from central CA to Baja CA



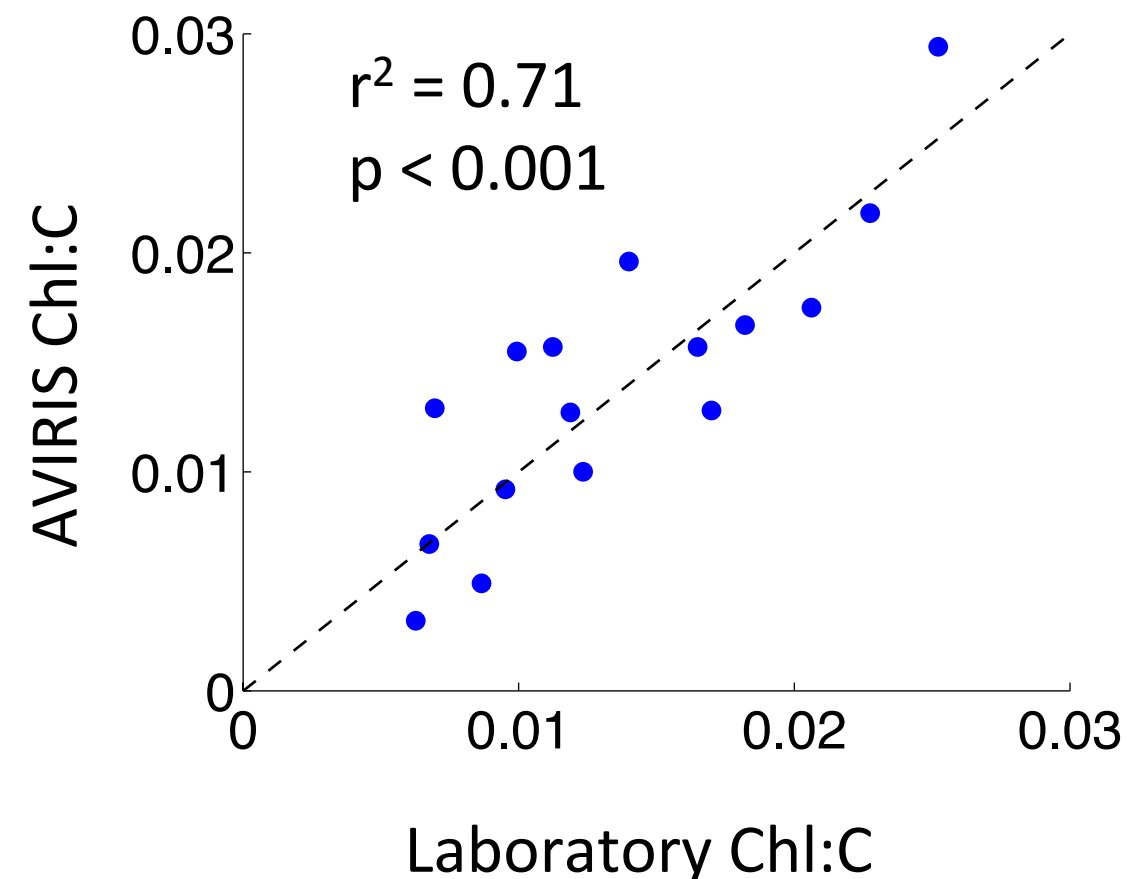
Canopy biomass of *Macrocystis pyrifera* (top) can be quantified from Landsat 5 imagery (bottom).

Hyperspectral aerial flights conducted 3x year⁻¹ in 2013 – 2015 using the AVIRIS sensor in HyspIRI preparatory campaign

Thomas Bell, David Siegel

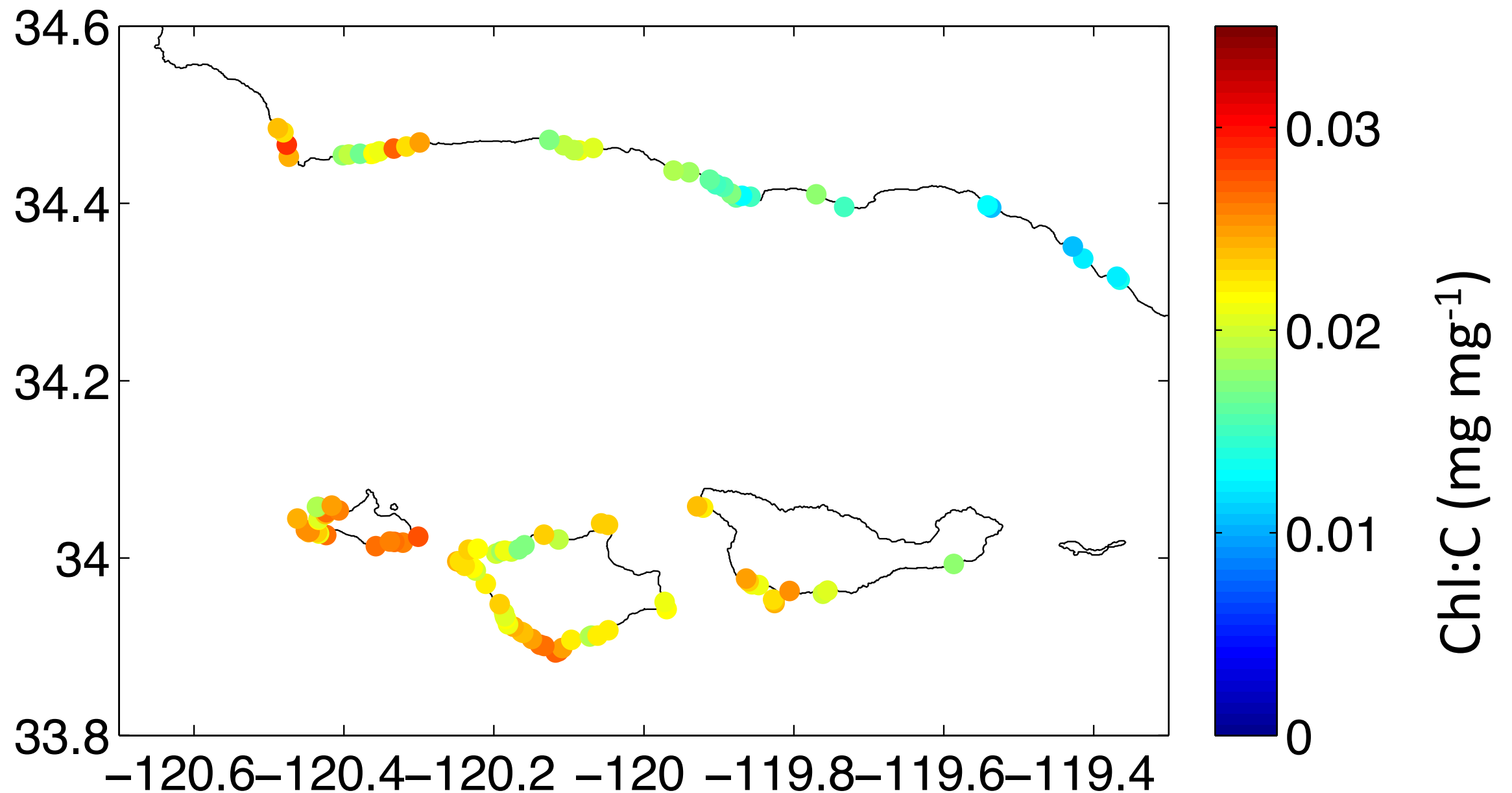


Chl:C estimated from
hyperspectral images closely
resembles Chl:C measured in
the laboratory



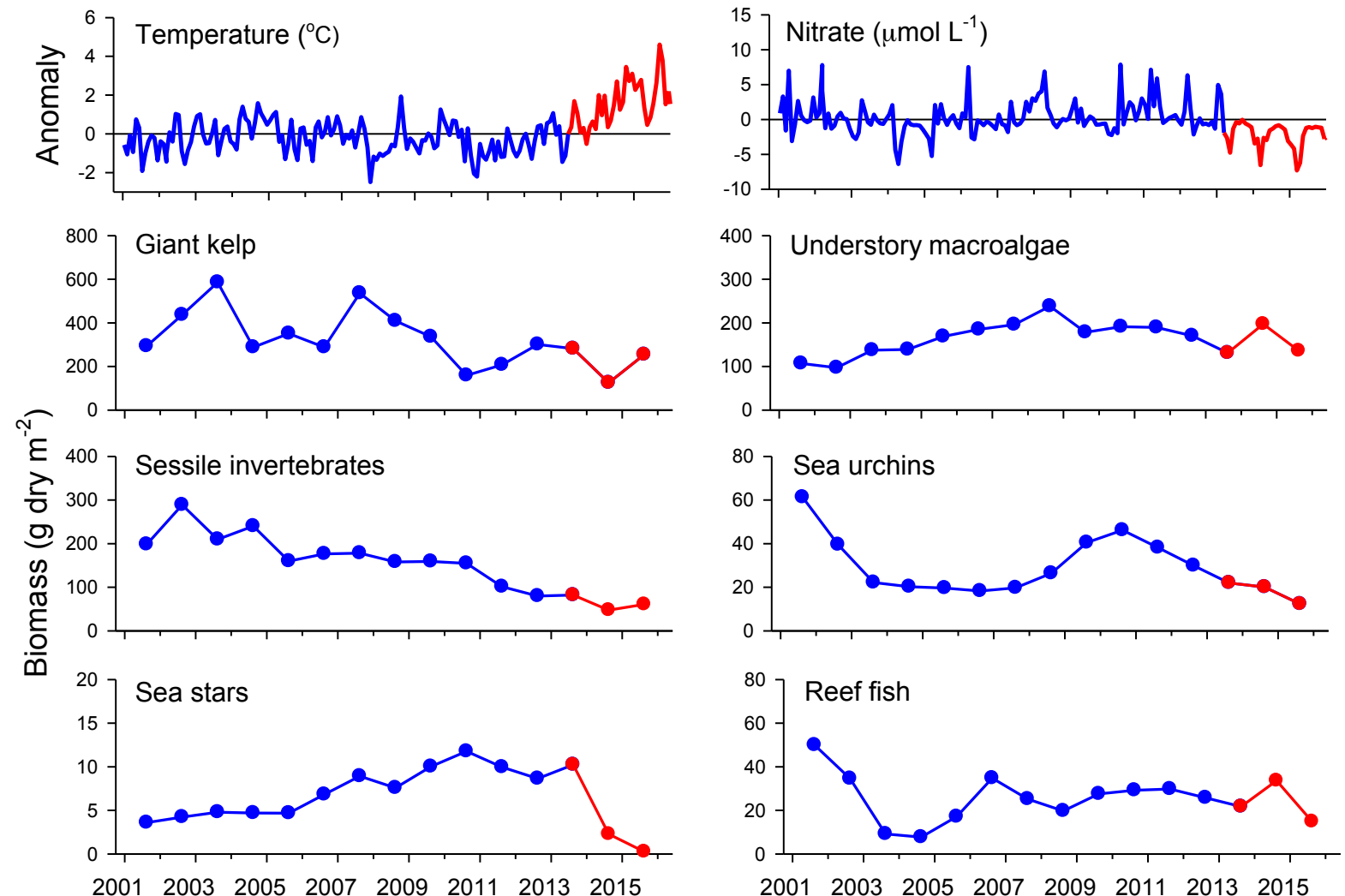
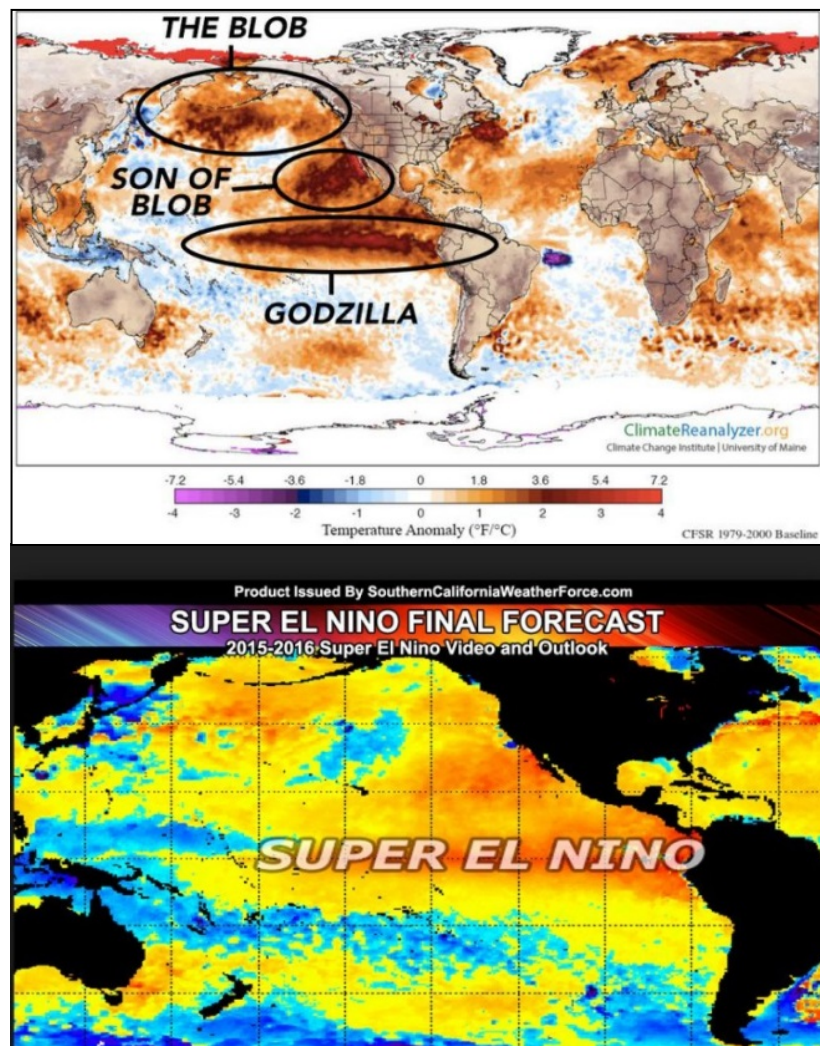
Regional patterns of kelp Chlorophyll mirror the east-west gradient of temperature and nutrients in the Santa Barbara Channel

Physiological Condition of Giant Kelp Canopy June 2015



Responses of kelp forest ecosystems to climate change

Extreme warming event allowed us to test IPCC predictions of kelp forest decline in response to sea temperature extremes



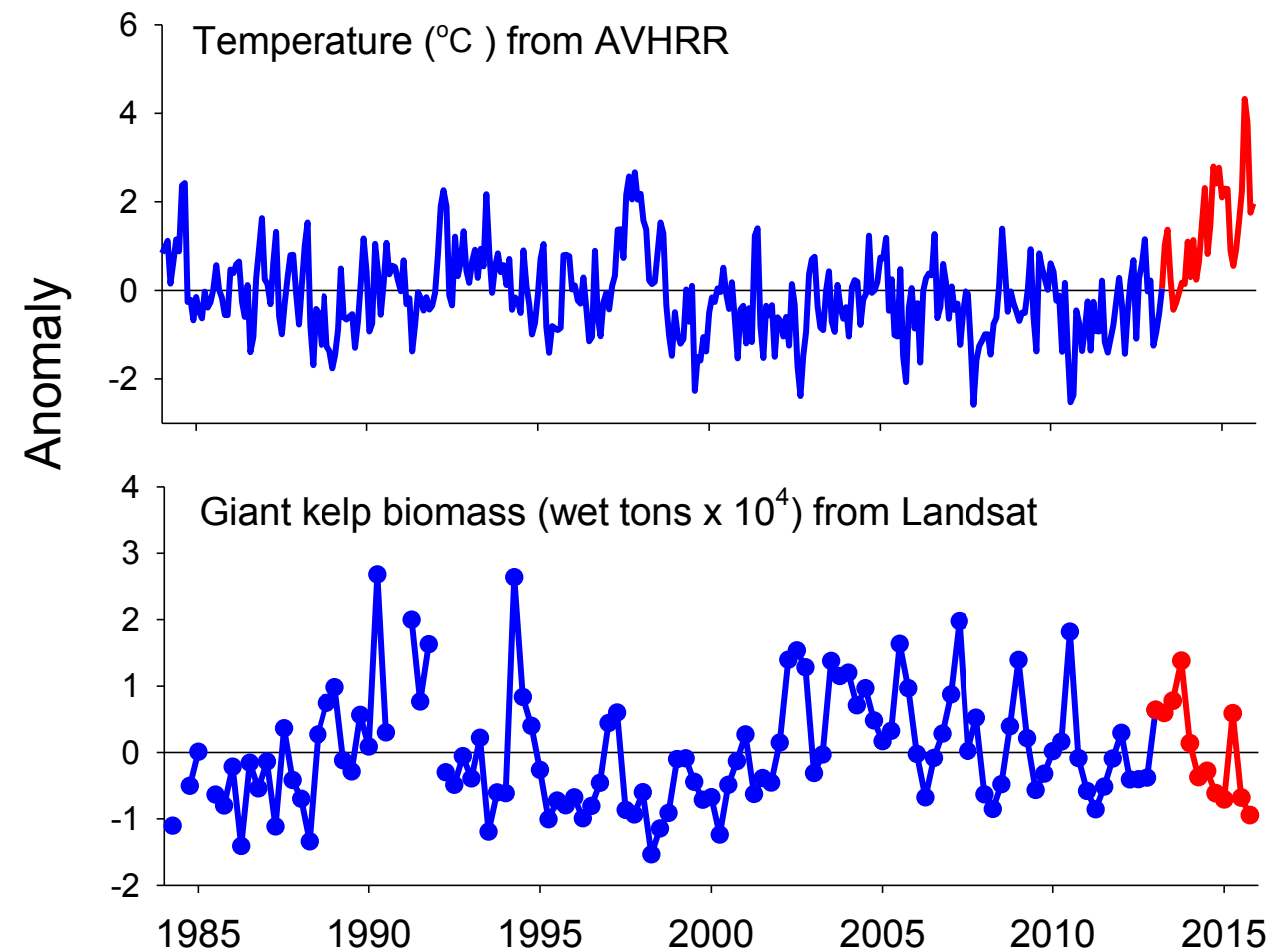
- Biomass of giant kelp and most kelp forest species of macroalgae, invertebrates and fish remained within their historical range in spite of 34 months of extraordinarily warm, nutrient depleted conditions
- Sea stars and sea urchins, key predators and grazers, declined due to disease

Data from satellite imagery used to extend spatial and temporal scales of analyses



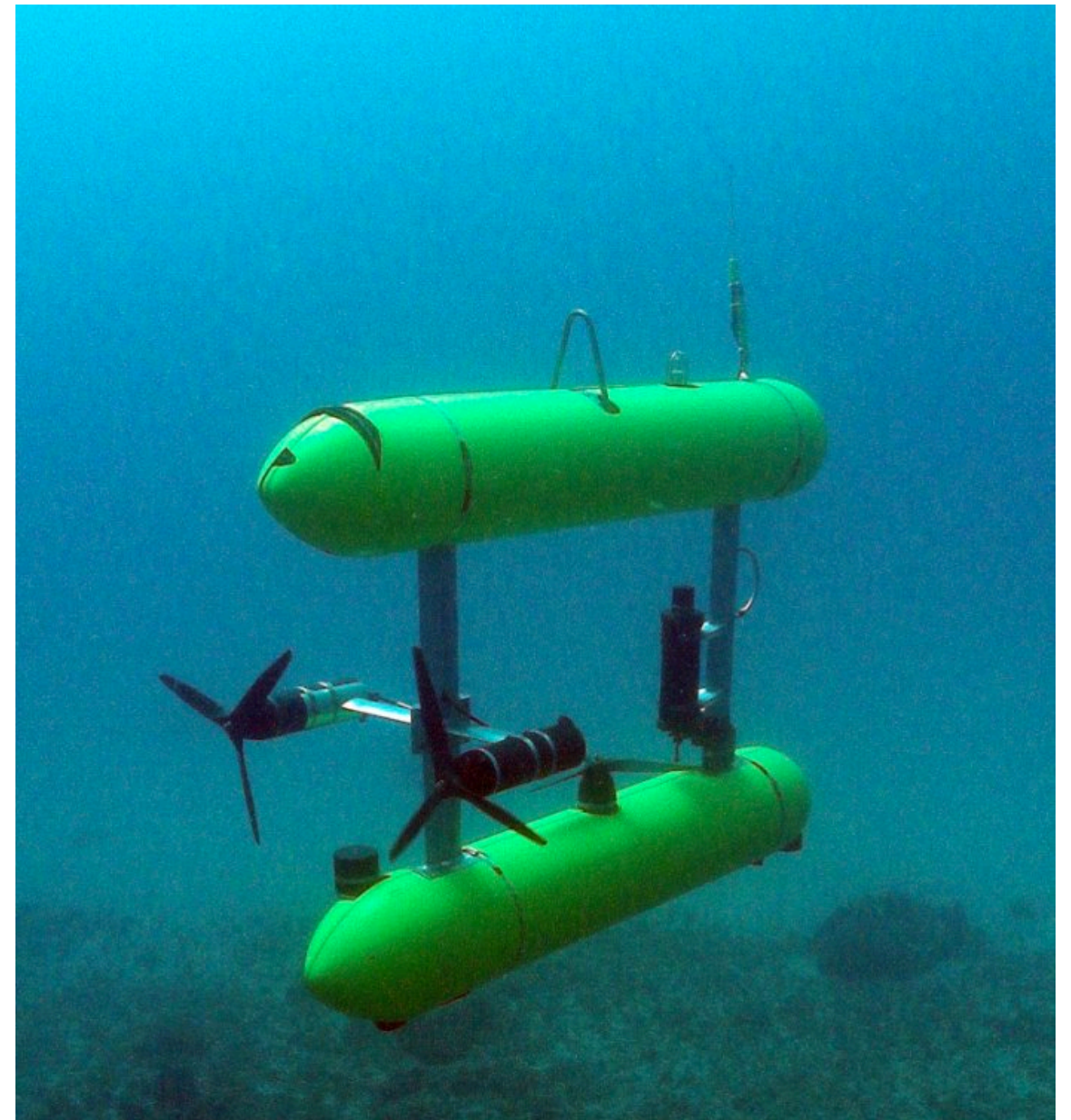
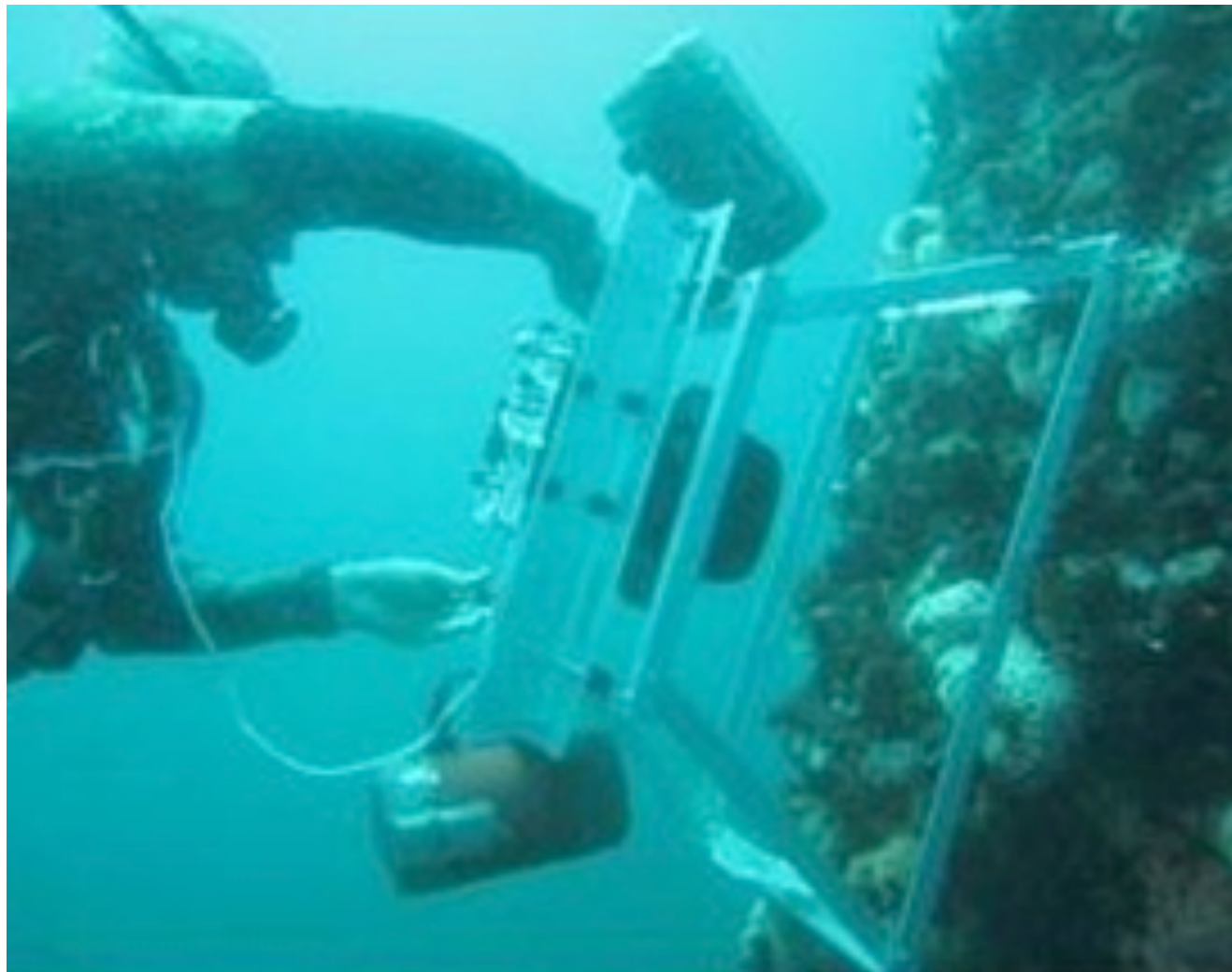
Longer & more spatially comprehensive data from satellites confirm the patterns documented by divers and instrumentation at our study sites

- Results reinforce the need for long-term biodiversity data and expose the risk of relying on species with seemingly sensitive traits as sentinels for ecosystem responses to climate change



Goal 2. Develop advanced methods in optical and acoustic imaging and genomics for monitoring biodiversity

Optical Imaging



Deep learning for image analysis

UCSB Center for Bio-image Informatics

Benefits

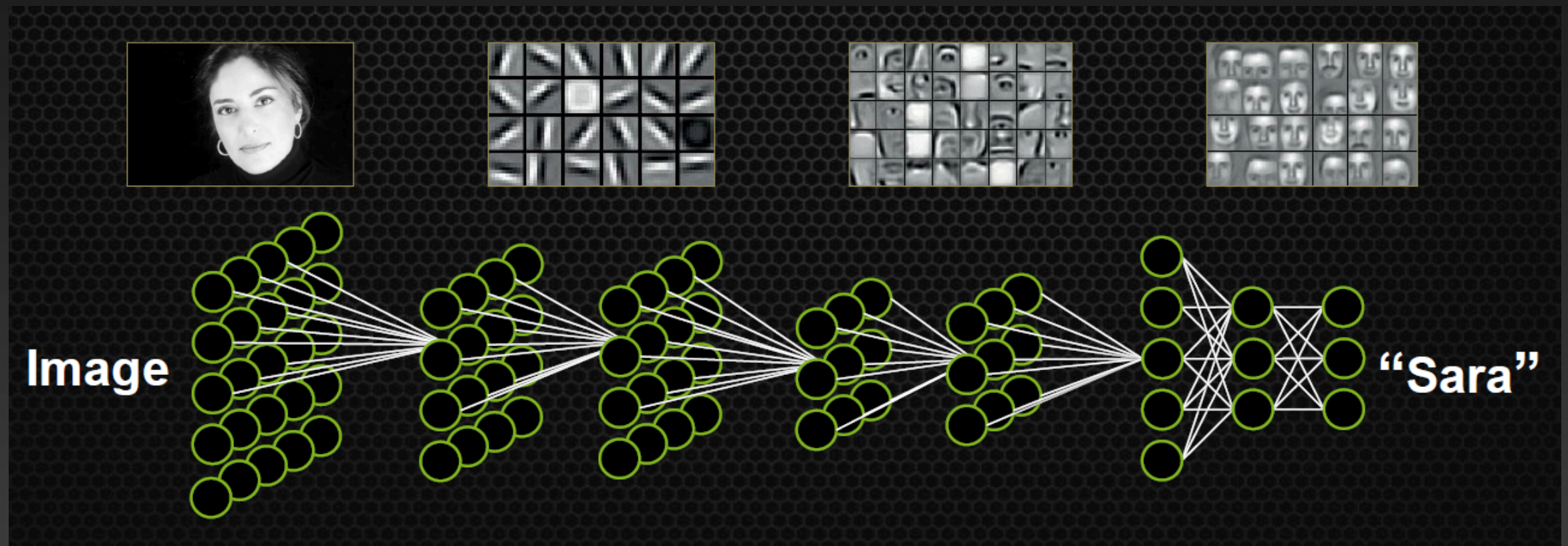
Fully automated - no feature selection

Fast classification on GPUs

High accuracy

Generalizes to any data

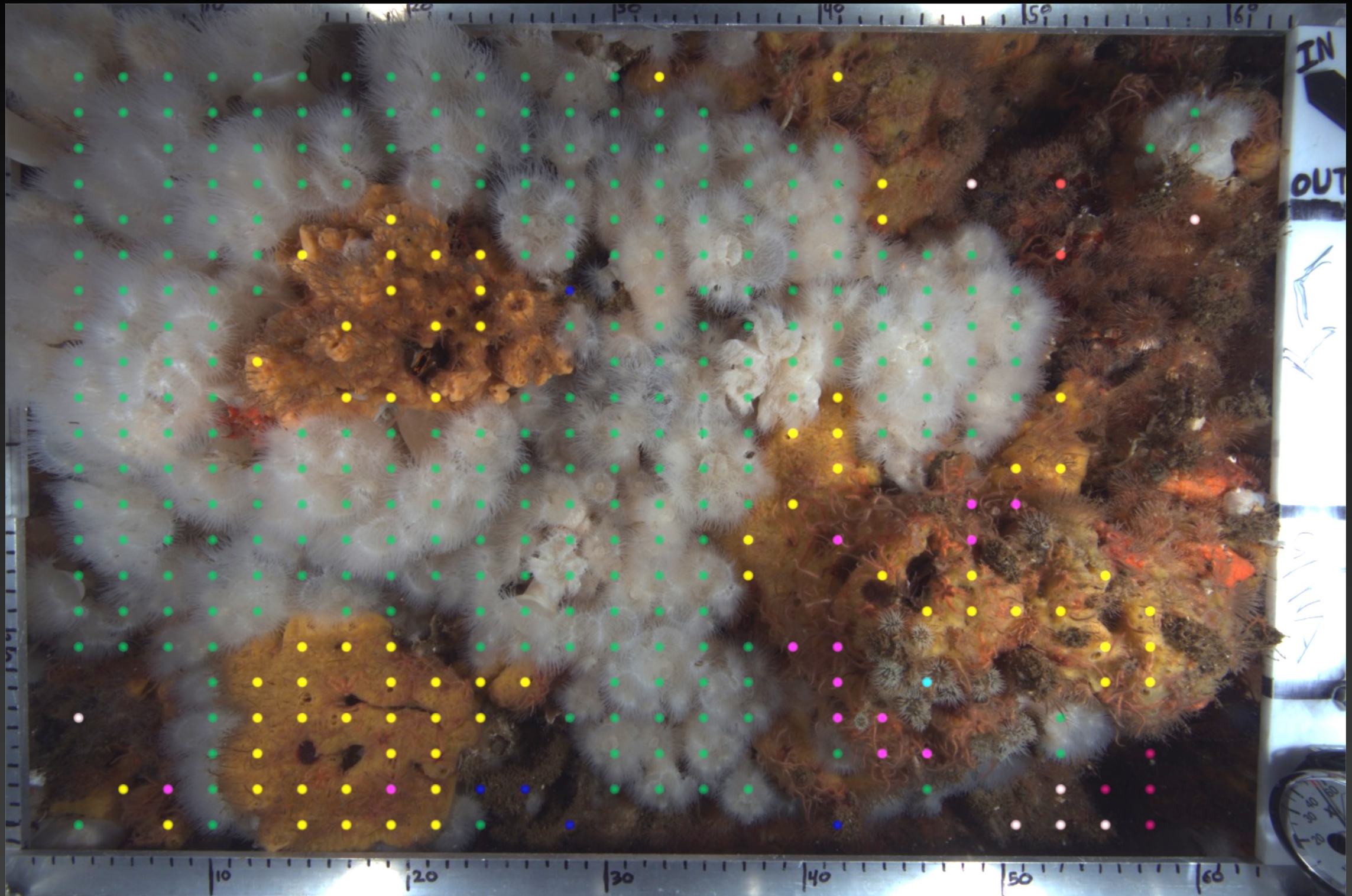
Convolutional Neural Network (CNN)



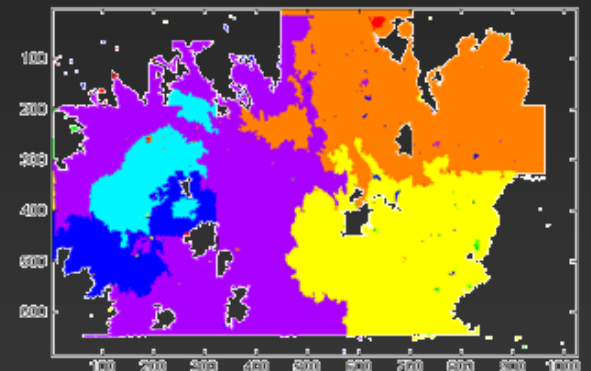
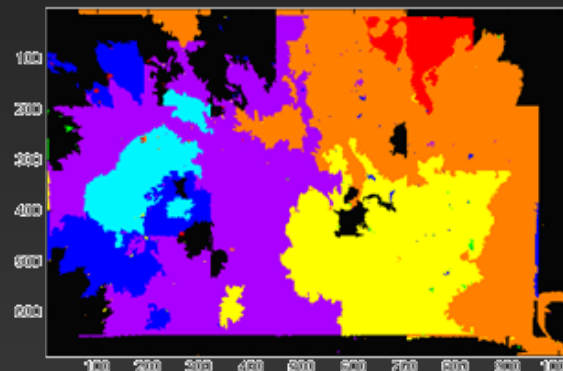
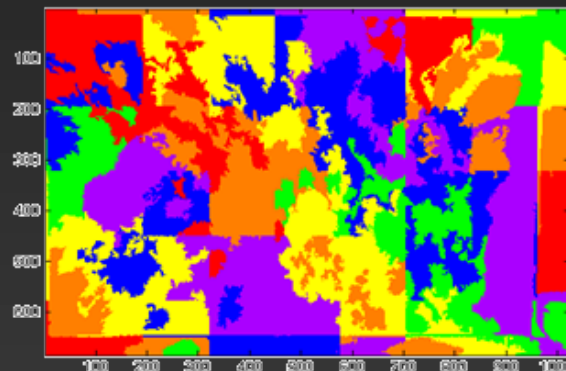
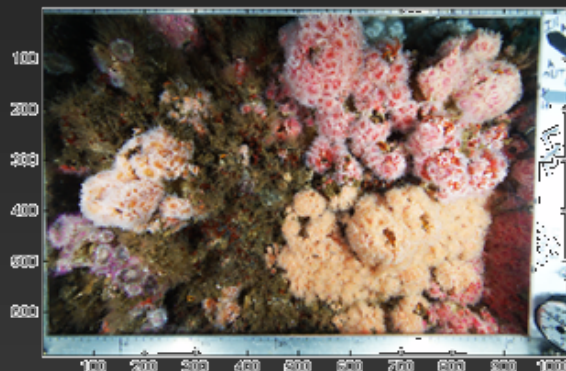
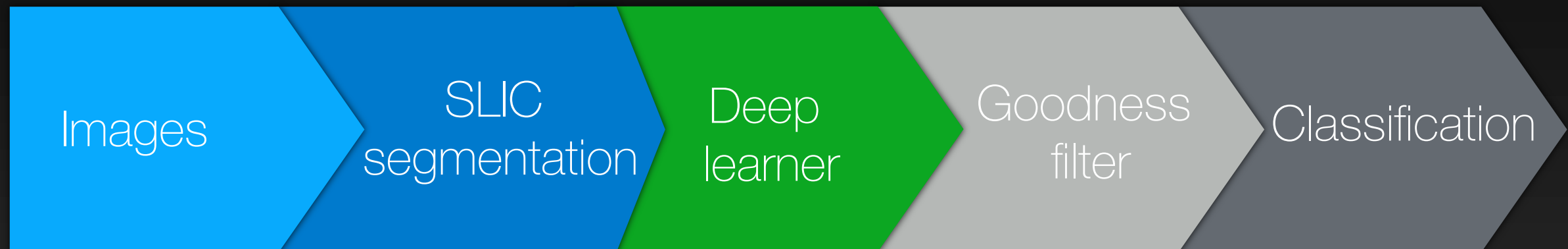
Convolutional levels: Feature extraction typically required an engineer to select or develop a feature descriptor with CNNs it is learned from data.

Classifier: fully connected layers

Percent cover at 95% goodness

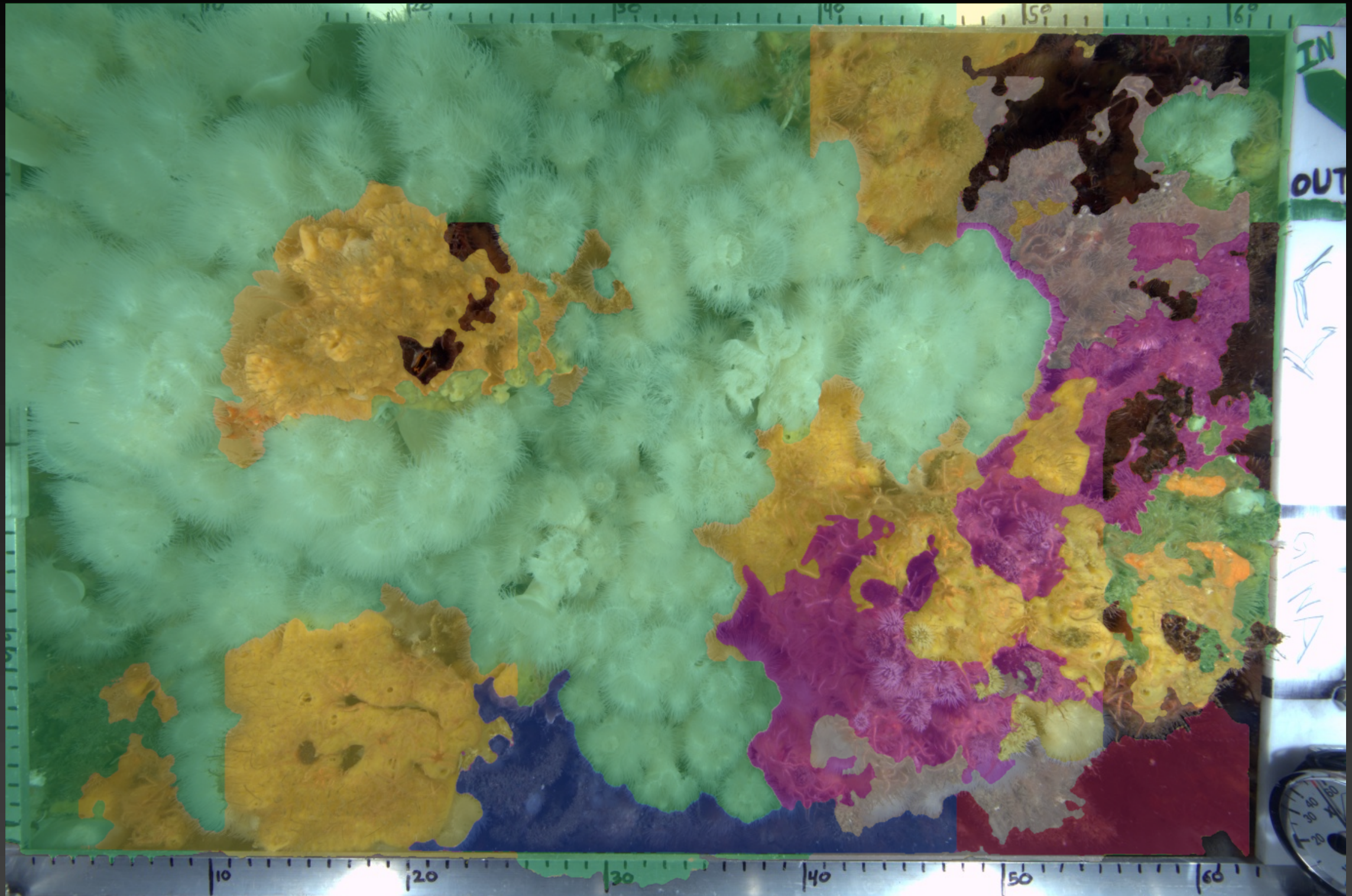


Semantic segmentation



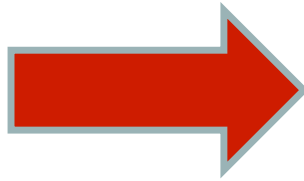
Dmitry Federov, Kris Kivekval, BS Manjunath

Segmentation at 95% goodness

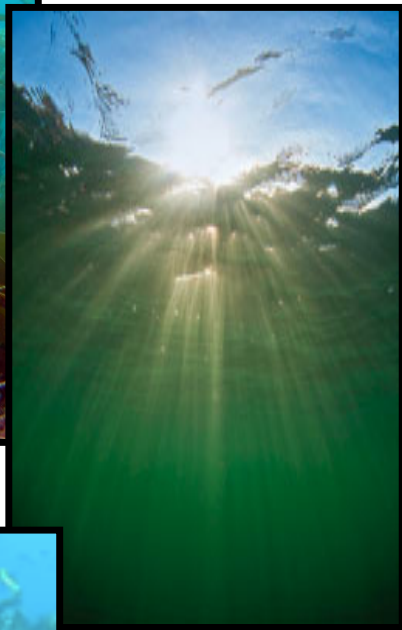


Goal 2. Develop advanced methods in optical and acoustic imaging and genomics for monitoring biodiversity

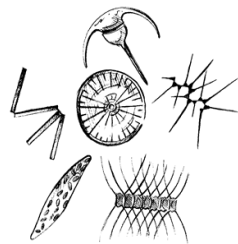
Ecosystem



**Total DNA
collected on
filters**



**Amplification of barcode
genes for particular groups
(prokaryotes to vertebrates)**



**A Genomic View of
Biodiversity Across
Multiple Trophic Levels**

Targets:

- Microbes
- Microplankton
- Ichthyoplankton
- eDNA



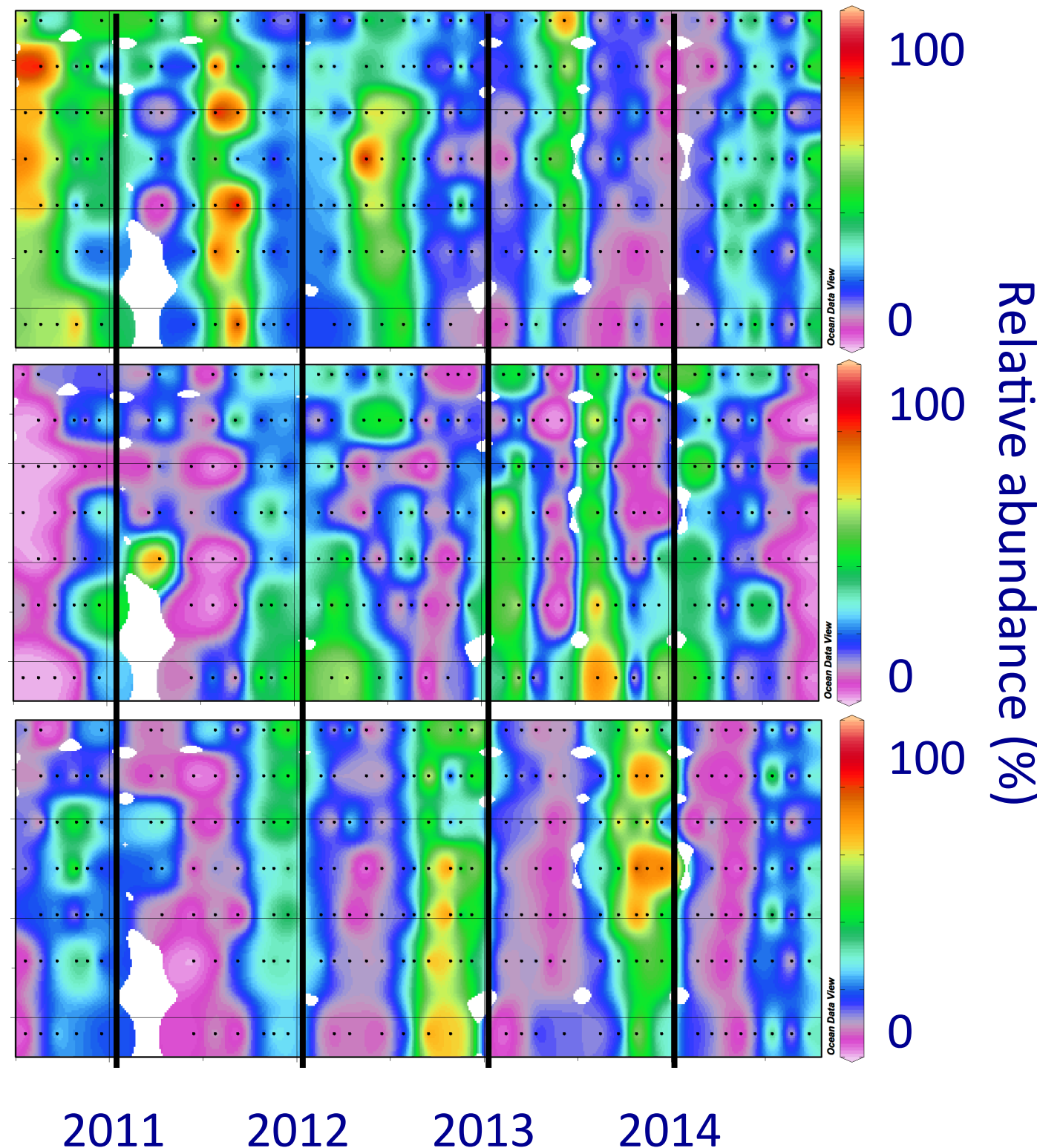
Time-series shows repeatable, seasonal surface bacterioplankton communities

SAR86

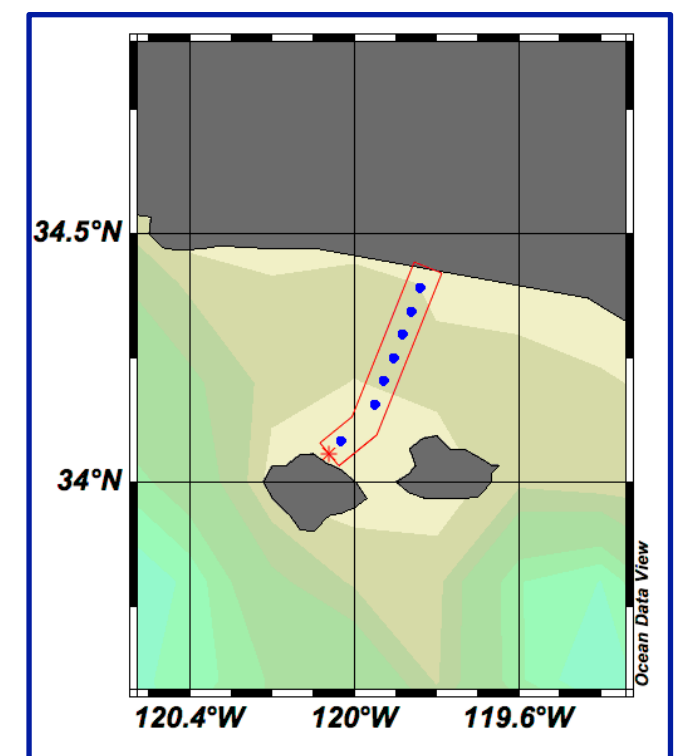
SAR11
Surface 1

SAR11
Surface 2

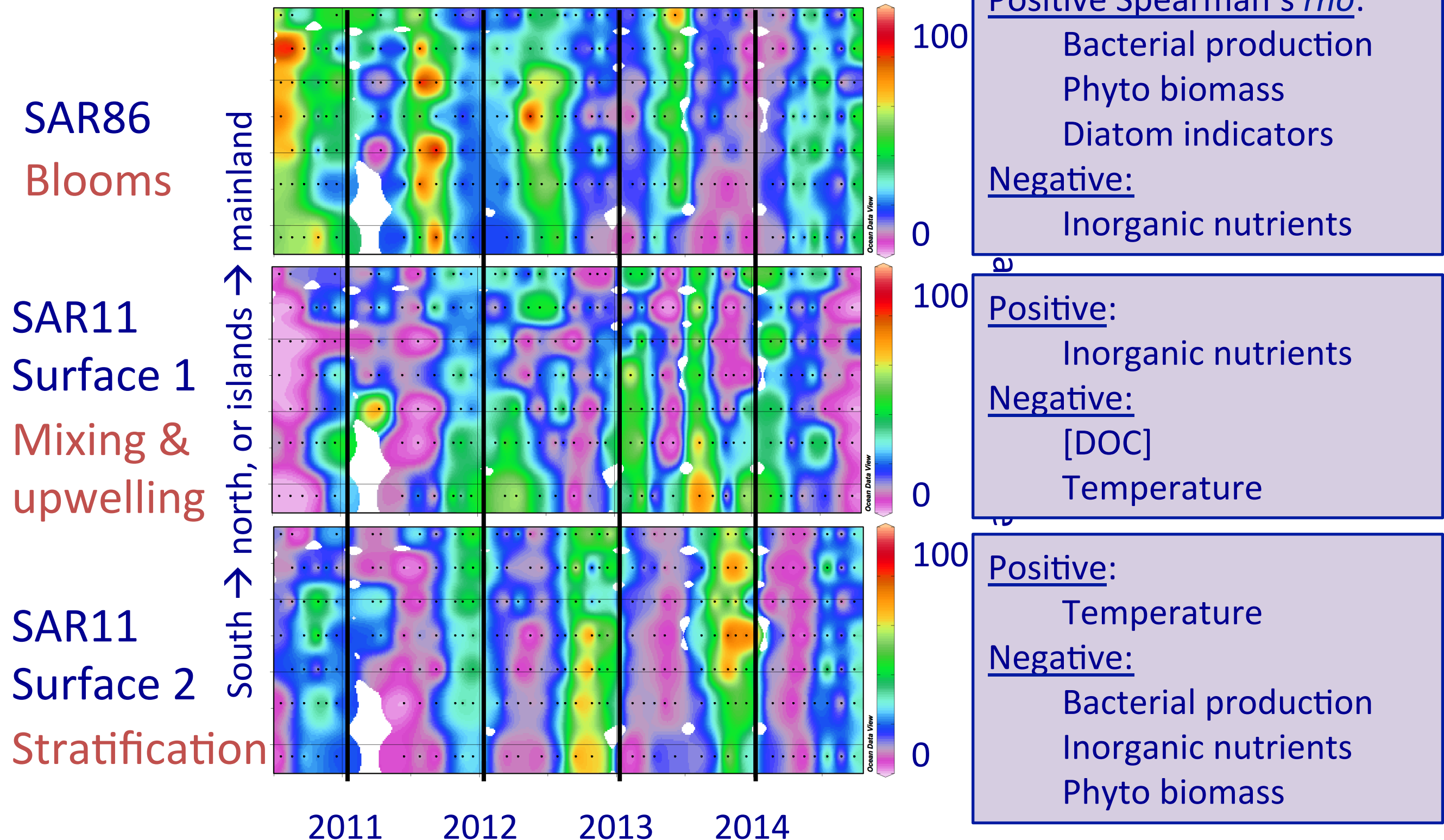
South → north, or islands → mainland



- Time-series on Plumes & Blooms cruise line
- 44 cruises, 2010-14
- Profile to 300m at center station
- new Earth Microbiome Project 16S rDNA primers



These dominant OTUs have clear, distinct correlations to bottom-up controls

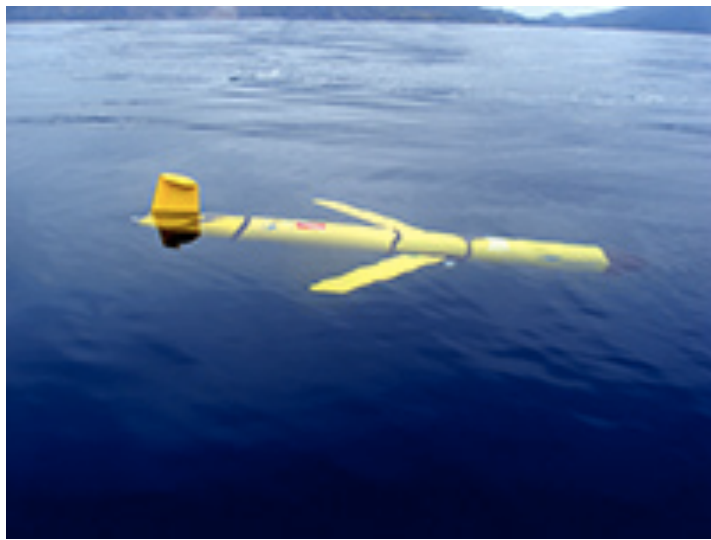


Now comparing 4 primer sets to examine relative biases in this system

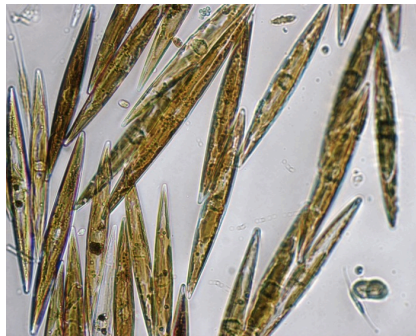
Primer set	Phylogenetic range	16S region	Reference	Why
515F-Y 806R-B	Bacteria & archaea	V4	Earth Microbiome Project; Apprill et al. 2015; Parada et al. 2015	Our existing illumina primer set
27F 338R	Bacteria	V12	Fortunato et al. 2012 (used in Wear et al. 2015)	Our old Roche-454 primer set
341F 785R	Bacteria & (some?) archaea	V34	Klindworth et al. 2012	C. Nelson at UH sees good results
515F-Y 926R	Bacteria & archaea	V45	Parada et al. 2015	Worked well in nearby basin

We are using a site-specific 16S clone mock community of known composition and ~ 90 unique environmental (mixed community) samples to assess the primers

Emma Wear, Craig Carlson



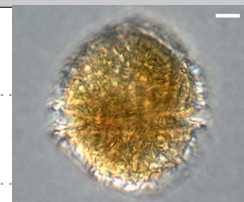
Fernanda Henderikx Freitas
David Siegel, Libe Washburn
Stuart Halewood, Erik Stassinis



Pseudo-nitzschia



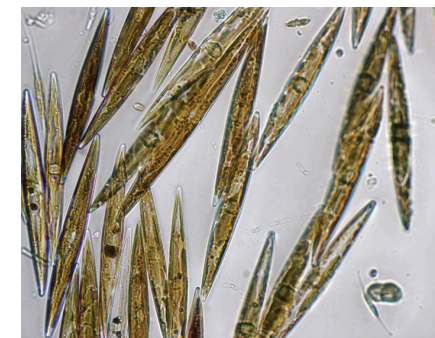
Prorocentrum



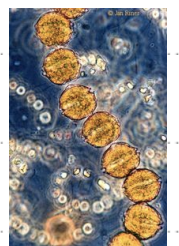
Lingulodinium



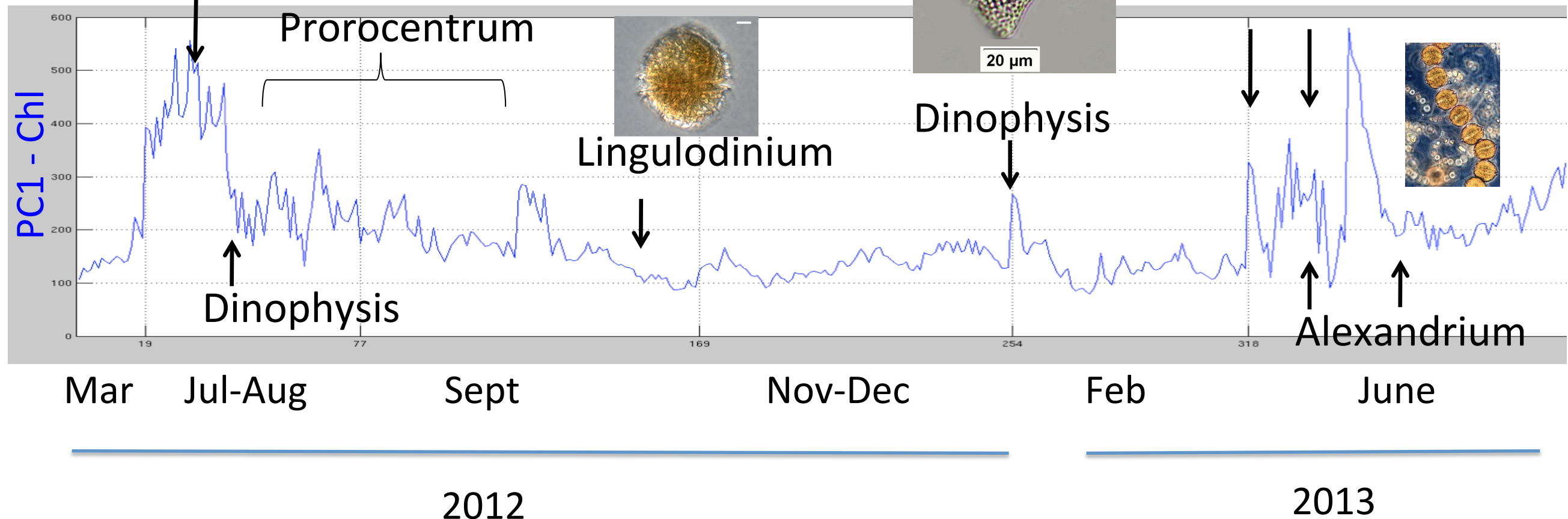
Dinophysis



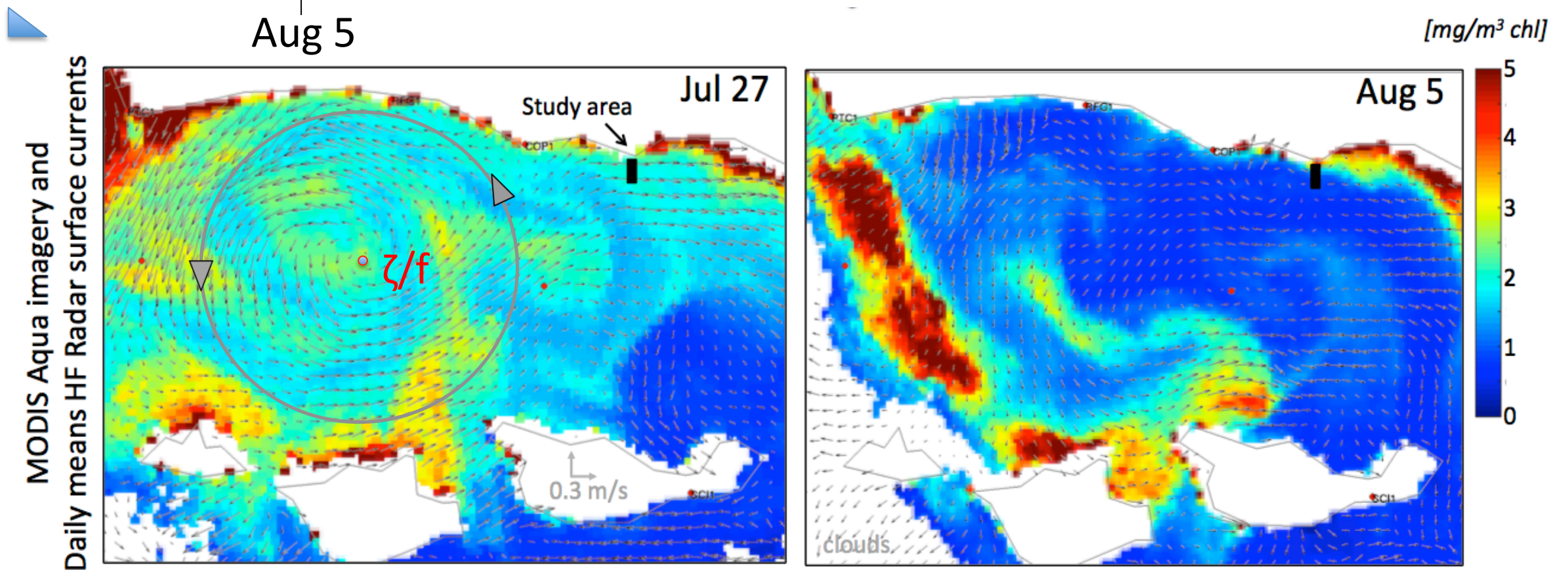
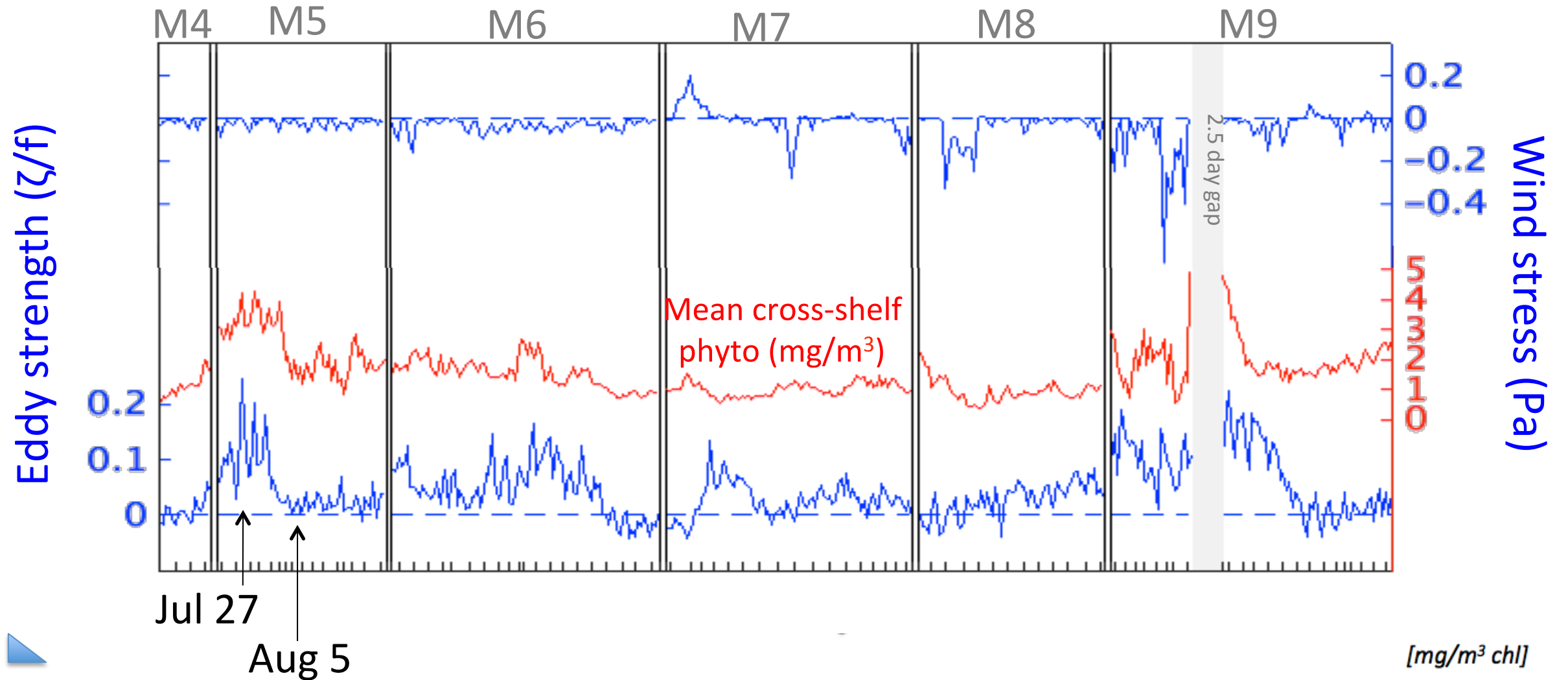
Pseudo-nitzschia



Alexandrium

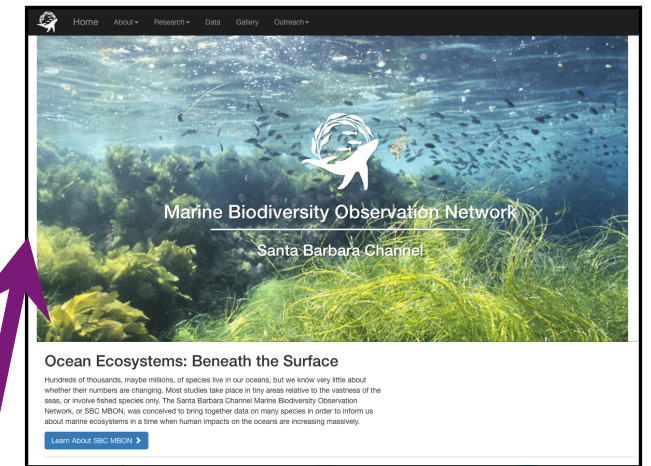


What drives Phytoplankton changes?

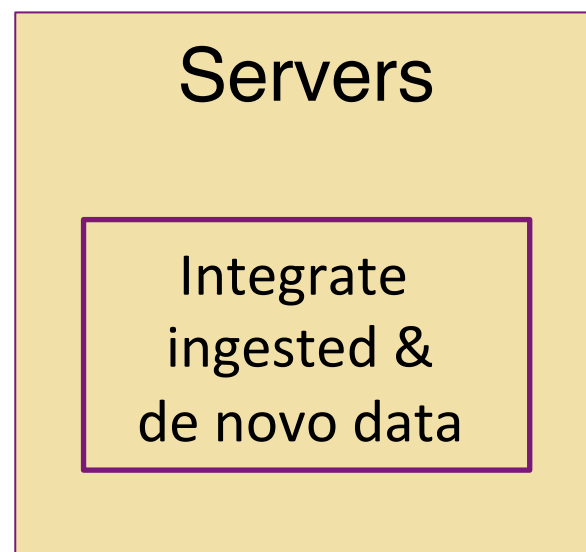


Santa Barbara Channel MBON IMS

- Adopted community protocols and standards per LTER
 - Relational Database Management System -> XML
 - Structural quality control
 - Local catalog
- Federation mechanism – DMAC group



DataONE
Member Node?

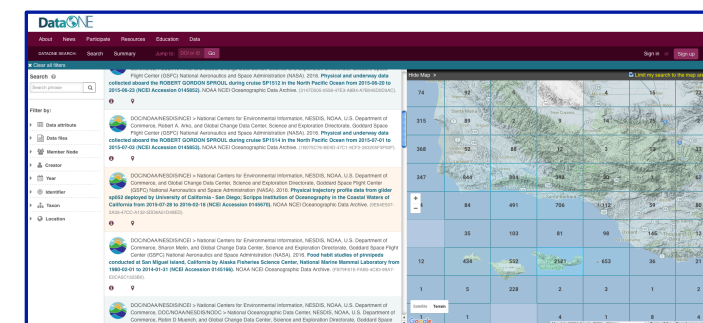


Data Package Design

DataSet		DataSetEntities	
DataSetID	int4[10]	DataSetID	
Accession	varchar[16]	EntityName	
Title	varchar[300]	EntityType	
Investigator	varchar[20]	EntityDescription	
DataSetType	varchar[10]	EntityRecords	
Georeferences	bool[1]	DataAnomalies	
SubmitDate	timestamp[29,6]	Alphanumeric	
Abstract	varchar[5000]	FlagCodes	
Status	varchar[50]	SpecialCodes	
ProjectRelease	timestamp[29,6]	SortOrder	
PublicRelease	timestamp[29,6]	EntityID	
DisplayOnWeb	bool[1]	< 2 323 rows 24 >	
Abstract_xml	xml[2147483647]	DataSetKeywords	
< 2 163 rows 22 >		Keyword	
		KeywordType	
		DataSetID	
		< 3 3,309 rows	
		DataSetLocations	

EML Metadata Export

Data Package Checking



IOOS, Marine
Cadastre, NODC,
etc.

SBC MBON Partner collaborations

- SCCWRP/NOAA SWFSC
 - Ichthyoplankton metabarcoding postdoc
 - Dovi Kacev started fall 2015
- NOAA NCCOS
 - Spatial linkage of physical habitat variables with biodiversity to improve forecasting ability
 - NCCOS lead Brian Kinlan
 - Rhiannon Rognstad starting Aug 2016